


## Advanced Computer Graphics (Fall 2009)

CS 294, Rendering Lecture 11  
Representations of Visual Appearance  
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<http://inst.eecs.berkeley.edu/~cs294-13/fa09>

## Realistic Rendering

**Geometry**



**Rendering Algorithm**




Arnold Renderer: Marcos Fajardo

**Materials/Lighting**  
Texture Reflectance [BRDF] Lighting

**Realistic Input Models Required**

## Production Pipeline

**3D Geometry**




Editing

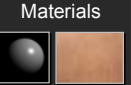
↔

**Rendering Algorithms**

→



**Materials**




Editing

↔


## Traditional Computer Graphics

**Directional**




Parametric Scattering Functions

**Spatial**



Hand Painted Texture Maps

## Traditional Computer Graphics



## Appearance in the Real World



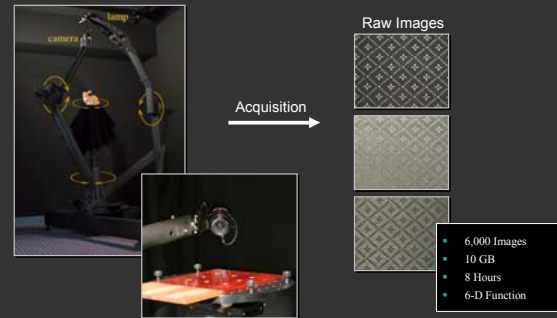





## Motivation

- Have reached the limit of simple parametric reflectance (or animation, geometric models)
- Input appearance models, not Algorithms for rendering are limiting factor in realism
- Improvements require data-driven models

## Data-Driven Appearance Models



Stanford/Cornell Graphics Labs

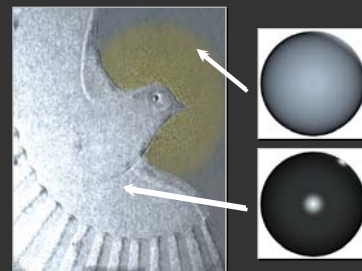
Lawrence *et al.* 06

## Motivation

- Have reached the limit of simple parametric reflectance (or animation, geometric models)
- Input appearance models, not Algorithms for rendering are limiting factor in realism
- Improvements require data-driven models
- **Measure real-world visual appearance and represent**
  - What types of datasets to measure or acquire?
  - What mathematical representations to use?

## The SVBRDF

Spatially  
Varying  
Bi-Directional  
Reflectance  
Distribution  
Function



$$S(u, v, \mathbf{V}, \mathbf{L})$$

## General Problem Characterization

6D Spatially-Varying Reflectance (SVBRDF)

- Lighting direction (2D)
- Viewing direction (2D)
- Spatial location (2D)

With  $\sim 100$  samples per dimension

- $\sim 10^{12}$  samples total!!
- Intractable representation, rendering

Need usable compact representations that enable

- Interactive rendering
- Global illumination (offline) rendering
- Editing

## Interactive Rendering



### Global Illumination

Measured Plastic

Measured Metallic-Blue Paint

Measured Nickel

Lawrence *et al.* 04

### Editing

Original Image

Adjust Material Properties

### BRDF Editing in Complex Lighting

Real-Time BRDF Editing in Complex Lighting  
Aner Ben-Artzi Ryan Overbeck Ravi Ramamoorthi

### Types of Measured Visual Appearance

- Lighting: From point lights to environment maps and beyond

Grace Cathedral and Kitchen light probes  
Courtesy Paul Debevec [www.debevec.org](http://www.debevec.org)

- BRDFs: From Lambertian/Cook Torrance to measured/factored


### Types of Measured Visual Appearance

- “Reflectance Fields”: Variation with lighting and/or view
- Subsurface and Volumetric Scattering
- Time-Varying Surface Appearance
- BTFs or Bi-Directional Texture Functions
- And many more (full taxonomy later)


### Time-Varying Appearance: [Video](#)




## Wood + Tape Dataset




Blending Weights Computed with **ACLS** (5 Terms)




Scotch Tape




Dark Wood Grain



Light Wood Grain

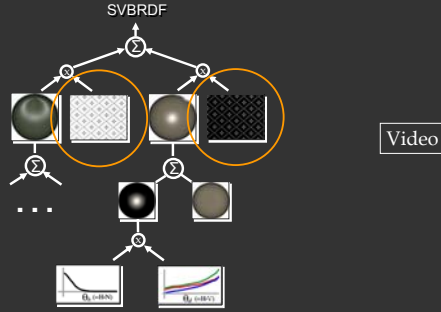


Red Bicycle Tape



White Bicycle Tape

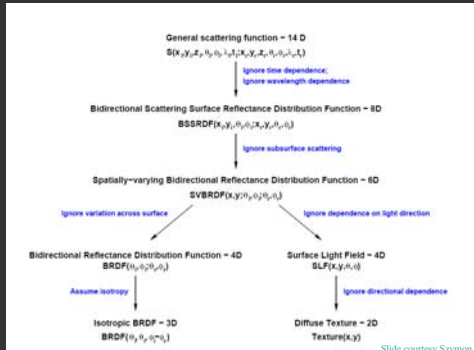
## Data-Driven Editing: Spatial Texture



## Historical Overview

- 1980-95: Focus on parametric reflectance models, fast offline finite element and Monte Carlo rendering algorithms
- Circa 1995: Focus shifts to input appearance models. Measured BRDFs and image-based rendering prominent
- 1998- : Strong interest in data-driven appearance. But these are gigantic datasets. Focus: efficiently represent
- 2002- : Relevant even for purely synthetic real-time rendering: Precompute data-driven models, represent efficiently
- Great deal of current work on acquiring and representing realistic lighting, materials...

## Taxonomy of Appearance



Slide courtesy Szymon Rusinkiewicz

## General Plenoptic Function

- All knowledge of light in scene [Adelson 91]
- Anywhere in space  $(x, y, z)$
- In any direction  $(\theta, \phi)$
- At any time instant  $(t)$
- For any wavelength of light  $(\lambda)$
- Function of 7 variables, therefore 7D function
- We care about taxonomy of *scattering functions*
  - General Scattering Function is 14D (bet. two plenoptics)
$$f(x_i, y_i, z_i, \theta_i, \phi_i, \lambda_i, t_i; x_o, y_o, z_o, \theta_o, \phi_o, \lambda_o, t_o)$$

## Common Assumptions

- Ignore time dependence (no phosphorescence or time-varying BRDF properties [but see my work on T(S)VBRDFs])
- Ignore wavelength (no fluorescence, assume RGB)
- Travel in free space, parameterize on surfaces (no z)
  - Alternative for light fields: 4D space of rays (intersections in 2 planes)
- Each of these removes 1D of plenoptic, 2D of scattering
- Left with 8D function of greatest importance for class
- 8D Bi-Directional Surface Scattering Distribution Function (BSSRDF)  $f(x_i, y_i, \theta_i, \phi_i; x_o, y_o, \theta_o, \phi_o)$

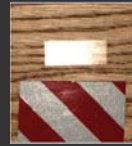
## Taxonomy of 8D Scattering Function

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

- Function of two spatial positions, two spherical angles (4 total)
- Can consider any subsets of 1-4 of these
  - Slices of the full 8D BSSRDF
- Number of possible slices is  $4+6+4+1 = 15$ .
  - Not all make sense, but most do and have begun to be studied
- Unified framework not readily known, presented in lecture**

## 6D Scattering Functions 1

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$



Ignore subsurface scattering  
 $\vec{x}_i = \vec{x}_o = \vec{x}$

$$f(\vec{x}, \vec{\omega}_i, \vec{\omega}_o)$$

Spatially-Varying BRDF (6D SVBRDF)  
 BiDirectional Texture Function (6D BTF)



SVBRDF Lawrence 06 Also, for relighting image, changing view CURET: Corduroy BTF

"Other" Functions (slices not open to easy interpretation).  
 See if you can find a good interpretation (briefly discuss later)

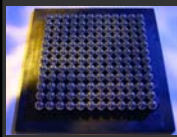
$$f(\vec{x}_i; \vec{x}_o, \vec{\omega}_o) \quad f(\vec{\omega}_i; \vec{x}_o, \vec{\omega}_o) \quad f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o) \quad f(\vec{x}_i, \vec{\omega}_i; \vec{\omega}_o)$$

## 4D "Scattering" Functions 1

$$f(\vec{x}, \vec{\omega}_i, \vec{\omega}_o)$$

$$f(\vec{x}, \vec{\omega}_i)$$

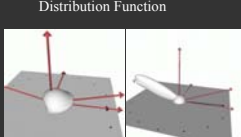
Incident Light Field



Unger et al. 03

$$f(\vec{\omega}_i, \vec{\omega}_o)$$

4D BRDF  
 BiDirectional Reflectance  
 Distribution Function



Oren-Nayar He et al.

From Oregon BRDF Library

$$f(\vec{x}, \vec{\omega}_o)$$

Surface Light Field



Wood et al. 00

## 2D Functions 1

$$f(\vec{x}, \vec{\omega}_i)$$

Incident Light Field

$$f(\vec{\omega}_i, \vec{\omega}_o)$$

BRDF

$$f(\vec{x}, \vec{\omega}_o)$$

Surface Light Field

$$f(\vec{\omega}_i)$$

Incident Illumination  
 Environment Map

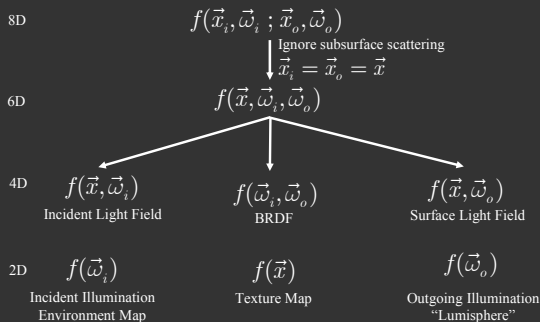
$$f(\vec{x})$$

Texture Map

$$f(\vec{\omega}_o)$$

Outgoing Illumination  
 "Lumisphere"

## Complete Branch of Taxonomy



## Taxonomy of 8D Scattering Function 1

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

- Function of two spatial positions, two spherical angles (4 total)
- Can consider any subsets of 1-4 of these
  - Slices of the full 8D BSSRDF
- Number of possible slices is  $4+6+4+1 = 15$ .
  - Not all make sense, but most do and have begun to be studied
- One (main) branch of this taxonomy seen so far**
  - A total of 8 slices (1+1+3+3)**
  - Now, proceed to consider other (more exotic) possibilities**




## 6D Scattering Functions 2

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

↓

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o)$$

Relighting images with 4D Incident Light Fields



Not studied  
(what it means?)

 $f(\vec{x}_i; \vec{x}_o, \vec{\omega}_o)$

Considered in  
SVBRDF

 $f(\vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$   
 $f(\vec{x}_i, \vec{\omega}_i; \vec{\omega}_o)$

Masselus et al. 03

## 4D Scattering Functions 2

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

↓

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o)$$

Relighting images with 4D Incident Light Fields

Ignore angular dependence ↓

$$f(\vec{x}_i; \vec{x}_o)$$

Subsurface Scattering




Image relighting  
(distant illum.)

 $f(\vec{\omega}_i; \vec{x}_o)$

Incident Light Field  
(already seen)

 $f(\vec{x}_i, \vec{\omega}_i)$

Peers et al. 06

## Taxonomy of 8D Scattering Function 1

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

- Function of two spatial positions, two spherical angles (4 total)
- Can consider any subsets of 1-4 of these
  - Slices of the full 8D BSSRDF
- Number of possible slices is **4+6+4+1 = 15**.
  - Not all make sense, but most do and have begun to be studied
- One (main) branch of this taxonomy
  - A total of 8 slices (1+1+3+3)
- Second branch of taxonomy
  - Relighting, incl. with incident light fields, subsurface scattering
  - 3 additional slices (0+1+2+0). **Total 11 (what happened others?)**

## Review of 8D and 6D

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

- 1 slice at 8D, 4 possible slices in 6D (drop any variable)
- We have seen only 2 possible slices. What happened others?
- Either remove a spatial dimension (1 slice)
  - Spatially varying BRDFs (spatial incident = outgoing)
  - Only 1 slice, not the two expected
- Or remove an angular dimension (1 slice)
  - Relighting with incident light fields
  - No easy interpretation for  $f(\vec{x}_i; \vec{x}_o, \vec{\omega}_o)$

## Review of 4D

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

- 6 possible 4D slices (choose 2 variables out of 4)
- Seen 3 of these in main branch (from 6D SVBRDF)
  - BRDF
  - Incident Light Field
  - Surface Light Field
- Another 2 in second branch
  - Subsurface scattering (heterogeneous)
  - Relighting
- Only 5 of the 6 slices studied
  - No easy interpretation for  $f(\vec{x}_i; \vec{\omega}_o)$

## Review of 2D

$$f(\vec{x}_i, \vec{\omega}_i; \vec{x}_o, \vec{\omega}_o)$$

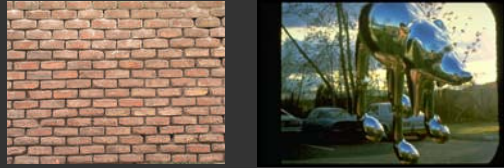
- 4 possible 4D slices (choose 1 variable out of 4)
- Seen 3 of these in main branch (from 6D SVBRDF)
  - Diffuse texture (only 1 slice)
  - Incoming environment map
  - Outgoing lumisphere

## Historical Timeline

- Built up from 2D to 4D to 6D to 8D functions
  - 2D functions (texture, env maps) known since 1975-80
  - 4D functions (light fields) in 1996 catalyzed revolution
  - 6D functions (CURET 1999, Incident LF 2003)
  - 8D functions 2006, first acquisitions of full transport
- Generally, individual papers on each topic
- General framework and theory only now emerging

## Historical Timeline: Details 2D

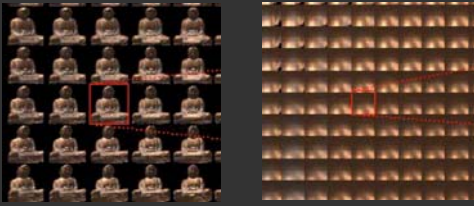
- Texture Maps [Catmull 1974]
- Environment Maps [Blinn 76, Miller & Hoffmann 84]



- “Lumispheres” not much work on alone (most in context of surface light fields, relighting)

## Historical Timeline: Details 4D

- BRDFs have a long history (70<sup>s</sup> – 80<sup>s</sup>), but work on measuring them is accelerating in last 10 years
- Light Field Rendering / Lumigraph
  - Levoy and Hanrahan 96 ; Gortler et al. 96

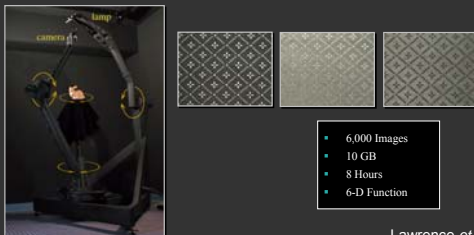


## Historical Timeline: Details 4D

- BRDFs have a long history (70<sup>s</sup> – 80<sup>s</sup>), but work on measuring them is accelerating in last 10 years
- Light Fields and more general 4D functions
  - Reflectance fields (relighting faces) Debevec et al. 00
  - Surface Light Fields (Wood et al. 00 ; Nishino et al. 99)
  - Incident Light Fields (Unger et al. 03 ; Goesele et al. 03)
  - Heterogeneous Subsurface Scattering (Peers et al. 06)

## Historical Timeline: Details 6D

- Spatially varying BRDFs have long history but dense measurement previously impossible
  - Now BTF (CURET 99), Factored forms (Lawrence 06) etc.



## Historical Timeline: Details 6D

- Spatially varying BRDFs have long history but dense measurement previously impossible
  - Now BTF (CURET 99), Factored forms (Lawrence 06) etc.
- Relighting with Incident Light Fields
  - Masselus et al. 03
  - Dual Photography: Sen et al. 05





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## The holy grail of 8D

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- Complete light transport of a complex scene
- No complete solutions yet, but first papers have appeared (Garg et al. 06)
  
- At this point, all 11 functions in taxonomy have had at least the first paper on them (although there is still much to do)